Verifying Probabilistic Correctness in Isabelle with pGCL

David Cock

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Verification

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Stochastic Behaviour in Systems

• Functional vs. Probabilistic Verification

- pGCL in Isabelle/HOL
- Example: Lattice-Lottery Scheduler



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The L4.verified proof tells us that if its assumptions are satisfied, seL4 will *definitely* not crash.



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Some things are inherently unpredictable:



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Some things are simply too complex to model:



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The L4.verified proof tells us that if its assumptions are satisfied, seL4 will *definitely* not crash.

Sometimes however, we're forced to live with uncertainty.

Some things are inherently unpredictable: Device failure.

Some things are simply too complex to model:

A modern processor.



Stochastic Behaviour in Systems

Verification

Classical nondeterminism is the ultimate in pessimism: Anything that *can* happen *will* happen.

If we know how events are distributed, we can do better.

Probabilistic models are a halfway-house between full nondeterminism and full predictability.

Probabilistic guarantees are relevant both for security, and for reliability.

Our current work is on probabilistic security guarantees.



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Why is this relevant in systems?



Feed a secret string and a guess to strcmp:

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Why is this relevant in systems?



Feed a secret string and a guess to strcmp:

This is a side-channel, which exposes the secret.



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Systems

Why is this relevant in systems?



Feed a secret string and a guess to strcmp:

This is a side-channel, which exposes the secret. How bad is it? How can we mitigate it? How will it behave in a larger system?



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Probabilistic verification can help us answer these questions.



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୬ ୯.୧ 6/30 Probabilistic verification can help us answer these questions. We want to show something like:

$$\wp \left((r, au) := ext{strcmp}(g,s); \ g := ext{cleverness}(r, au,g)
ight) (g=s) \leq 2^{-100}$$



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Probabilistic verification can help us answer these questions. We want to show something like:

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ight) (g=s) \leq 2^{-100}$$

Formulating this rigorously is the subject of our existing work. Mechanising this work in Isabelle/HOL ensures our reasoning is sound, and scalable to large problems. We use pGCL, an extension of Dijkstra's GCL with probability.



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$${x = 0} y := x^2 {y = x}$$



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$$\{x = 0\} \ y := x^2 \{y = x\}$$

This relates a program to an annotation. If x = 0 holds before, then y = x holds afterwards.

Is x = 0 maximal?



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 ${x = 0 \lor x = 1}$ is maximal, it is the *weakest precondition* of ${y = x}$.



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$$\wp a Q \equiv \sup \{P | P a Q\}$$

 $\{R\} \leq \{S\} \equiv R \vdash S \equiv \forall s. \ R \ s \rightarrow S \ s$



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Nondeterminism allows us to underspecify a program.

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୍ର ୦ ୦ ୨/30 Nondeterminism allows us to underspecify a program.

We write $a \sqcap b$ for 'Do either a or b'.

We let a demon make the choice, who tries to trip us up.



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Nondeterminism allows us to underspecify a program. We write $a \sqcap b$ for 'Do either *a* or *b*'.

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What is
$$\wp$$
 ($y := x^2 \sqcap y := 2x$) ($y = x$)?

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Nondeterminism allows us to underspecify a program. We write $a \sqcap b$ for 'Do either *a* or *b*'.

We let a demon make the choice, who tries to trip us up. What is $\wp (y := x^2 \sqcap y := 2x) (y = x)$? Algebraically: $\wp (a \sqcap b) Q = \wp a Q \cap \wp b Q$



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Nondeterminism allows us to underspecify a program. We write $a \sqcap b$ for 'Do either *a* or *b*'.

We let a demon make the choice, who tries to trip us up. What is $\wp (y := x^2 \sqcap y := 2x) (y = x)$? Algebraically: $\wp (a \sqcap b) Q = \wp a Q \cap \wp b Q$ Thus $P = \{x = 0 \lor x = 1\} \cap \{x = 0\} = \{x = 0\}.$

We are treating annotations as sets.

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Functional vs

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So far, \wp defines a set; What about \wp as a probability?



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So far, \wp defines a set; What about \wp as a probability? Identify a set with its selector:



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So far, \wp defines a set; What about \wp as a probability? Identify a set with its selector: «*P*» $s \equiv 1$ if $s \in P$ else 0.



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So far, \wp defines a set; What about \wp as a probability? Identify a set with its selector: «*P*» $s \equiv 1$ if $s \in P$ else 0. We can still order these: «*P*» \leq «*Q*» $\equiv \forall s.$ «*P*» $s \leq$ «*Q*» sNote: $\wp (a \sqcap b)$ «*Q*» =min ($\wp a$ «*Q*») ($\wp b$ «*Q*»).



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The 'weakest precondition' is the *least* value that the postcondition may take, from a given initial state.

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The 'weakest precondition' is the *least* value that the postcondition may take, from a given initial state.

It is the pessimistic *expected value* of the postcondition.



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The 'weakest precondition' is the *least* value that the postcondition may take, from a given initial state.

It is the pessimistic *expected value* of the postcondition.

These quantitative predicates are called *expectations*.



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What if the demon were a gambler?



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ક ્ઝેલ્≪ 11/30 What if the demon were a gambler?

 $a_{1/2} \oplus b$ means 'flip a coin — if heads *a* otherwise *b*'. What should \wp ($y := x^2_{1/2} \oplus y := 2x$) (y = x) be?



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 $a_{1/2} \oplus b$ means 'flip a coin — if heads *a* otherwise *b*'. What should \wp ($y := x^2_{1/2} \oplus y := 2x$) (y = x) be? For an expectation, we'd take the weighted average:

$$\wp (a_p \oplus b) F = p \times \wp a F + (1 - p) \times \wp b F$$



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$$\wp (a_p \oplus b) F = p \times \wp a F + (1 - p) \times \wp b F$$

 $\wp(a \ _{p} \oplus b)(y = x)$ s is the probability that, if we start in state s, y = x holds in the final state.



Functional vs Probabilistic Verification

What if the demon were a gambler?

 $a_{1/2} \oplus b$ means 'flip a coin — if heads *a* otherwise *b*'. What should \wp ($y := x^2_{1/2} \oplus y := 2x$) (y = x) be? For an expectation, we'd take the weighted average:

$$\wp (a_p \oplus b) F = p \times \wp a F + (1 - p) \times \wp b F$$

 $\wp (a_p \oplus b) (y = x) s$ is the *probability* that, if we start in state *s*, y = x holds in the final state. $\wp (a_p \oplus b) (y = x) 0 = 1$ and $\wp (a_p \oplus b) (y = x) 1 = 1/2$. All other values are zero.





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Combining Probability and Nondeterminism

How about this?

$$E = \wp \left((y := x^2_{1/2} \oplus y := 2x) \sqcap (y := x^2_{1/3} \oplus y := 2x) \right) (y = x)$$



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Combining Probability and Nondeterminism

How about this?

$$E = \wp \left((y := x^2_{1/2} \oplus y := 2x) \sqcap (y := x^2_{1/3} \oplus y := 2x) \right) (y = x)$$

Simply apply both rules:

$$E x = \min (1/2 \times (x = 0) \times (x = 1)) + 1/2 \times (x = 0))$$
$$(1/3 \times (x = 0) \times (x = 1)) + 2/3 \times (x = 0))$$

This time, E = 1 and E = 1/3.





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Combining Probability and Nondeterminism

How about this?

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$$E = \wp \left((y := x^2_{1/2} \oplus y := 2x) \sqcap (y := x^2_{1/3} \oplus y := 2x) \right) (y = x)$$

Simply apply both rules:

$$E x = \min (1/2 \times (x = 0) \vee x = 1) + 1/2 \times (x = 0))$$
$$(1/3 \times (x = 0) \vee x = 1) + 2/3 \times (x = 0))$$

This time, E = 1 and E = 1/3.

E x is the *minimum* probability that y = x will hold.





Functional vs. Probabilistic Verification

These are basics of pGCL (Morgan & McIver, 2004).

It's a formal model of computation incorporating probability and nondeterminism.

In the remainder of the talk I will introduce our mechanisation in Isabelle/HOL, and our work on the probabilistic verification of systems software.



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The pGCL package provides a shallow embedding into HOL.



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The pGCL package provides a shallow embedding into HOL. Expectations use the standard real number type:

 ${\pmb{E}}::\sigma \Rightarrow \mathbb{R}$

This allows us to use existing results directly.

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The pGCL package provides a shallow embedding into HOL. Expectations use the standard real number type:

 $E::\sigma \Rightarrow \mathbb{R}$

This allows us to use existing results directly. Expectations are nonnegative and bounded:

nneg $E \equiv \forall s. \ 0 \le E \ s$ bounded $E \equiv \exists b. \ \forall s. \ E \ s \le b$



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The pGCL package provides a shallow embedding into HOL. Expectations use the standard real number type:

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This allows us to use existing results directly. Expectations are nonnegative and bounded:

nneg $E \equiv \forall s. \ 0 \leq E \ s$ bounded $E \equiv \exists b. \ \forall s. \ E \ s \leq b$

The state space need not, in general, be finite.



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pGCL in Isabelle/HOL

$$\wp a :: (\sigma \Rightarrow \mathbb{R}) \Rightarrow \sigma \Rightarrow \mathbb{R}$$



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$$\wp a :: (\sigma \Rightarrow \mathbb{R}) \Rightarrow \sigma \Rightarrow \mathbb{R}$$

We usually restrict our attention to healthy transformers:



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We usually restrict our attention to healthy transformers:

 $\forall P b. bounded_by b P \land nneg P \rightarrow bounded_by b (t P) \land nneg (t P)$



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$$\wp a :: (\sigma \Rightarrow \mathbb{R}) \Rightarrow \sigma \Rightarrow \mathbb{R}$$

We usually restrict our attention to *healthy* transformers:

 $\forall P b. \text{ bounded_by } b P \land \text{nneg } P \rightarrow$ bounded_by $b (t P) \land \text{nneg } (t P)$ $\forall P Q. \text{ (sound } P \land \text{ sound } Q \land P \vdash Q) \longrightarrow (t P) \vdash (t Q)$



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 $\forall P b. \text{ bounded_by } b P \land \text{nneg } P \rightarrow \\ \text{bounded_by } b (t P) \land \text{nneg } (t P) \\ \forall P Q. \text{ (sound } P \land \text{sound } Q \land P \vdash Q) \longrightarrow (t P) \vdash (t Q) \\ \forall P c s. \text{ (sound } P \land 0 < c) \longrightarrow c \times t P s = t (\lambda s. c \times P s) s$



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pGCL in
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Abort $\equiv \lambda ab P$. if *ab* then λs . 0 else λs . bound_of P

We model both strict (WP) and liberal (WLP) semantics. All these primitives are healthy.

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Abort $\equiv \lambda ab P$. if ab then λs . 0 else λs . bound_of P $a \sqcap b \equiv \lambda ab P s$. min $(a \ ab P s) (b \ ab P s)$

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 $a \ _{p} \oplus b \equiv \lambda ab P s$. $p \times (a \ ab P s) + (1 - p) \times (b \ ab P s)$

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The shallow embedding makes it easy to embed the L4.verified nondeterministic monad:

Exec :: $(\sigma \Rightarrow (\alpha \times \sigma) \text{ set}) \Rightarrow \text{bool} \Rightarrow (\sigma \Rightarrow \mathbb{R}) \Rightarrow \sigma \Rightarrow \mathbb{R}$ Exec $M \equiv \lambda ab \ R \ s.$ glb { $R \ (\text{snd } sa). \ sa \in M \ s$ }



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Exec :: $(\sigma \Rightarrow (\alpha \times \sigma) \text{ set}) \Rightarrow \text{bool} \Rightarrow (\sigma \Rightarrow \mathbb{R}) \Rightarrow \sigma \Rightarrow \mathbb{R}$ Exec $M \equiv \lambda ab \ R \ s.$ glb $\{R \ (\text{snd } sa). \ sa \in M \ s\}$

We lift Hoare triples to probabilistic entailments:

$$\frac{\{P\} \text{ prog } \{\lambda r \text{ s. } Q \text{ s}\}}{\langle P \rangle \leftarrow \wp \text{ prog } \langle Q \rangle} \forall s. \text{ prog } s \neq \{\} \exists s. P \text{ s}\}$$



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One of the principle tools in verification is *refinement*.



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One of the principle tools in verification is *refinement*. A refinement relation allows us to transfer properties from *specification* to *implementation*:

$$\frac{a \sqsubseteq b \quad E \vdash \wp.a.F}{E \vdash \wp.b.F}$$



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One of the principle tools in verification is *refinement*. A refinement relation allows us to transfer properties from *specification* to *implementation*:

$$\frac{a \sqsubseteq b \quad E \vdash \wp.a.F}{E \vdash \wp.b.F}$$

Given *E*, if *a* establishes *F*, then so does *b* or:

$$\wp.a.F \leq \wp.b.F$$



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$$\frac{\mathsf{a}\sqsubseteq\mathsf{b}\quad\mathsf{E}\vdash\wp.\mathsf{a}.\mathsf{F}}{\mathsf{E}\vdash\wp.\mathsf{b}.\mathsf{F}}$$

Given *E*, if *a* establishes *F*, then so does *b* or:

$$\wp.a.F \leq \wp.b.F$$

In pGCL, an implementation establishes any property with at least as great a probability as its specification.





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pGCL in Isabelle/HOL

An approach to efficiently eliminating leaks through shared state e.g. caches.

Only switch to a domain with higher clearance, or to the downgrader, which clears the cache:



Stochastic Behaviour in Systems

Functional vs. Probabilistic Verification

pGCL in Isabelle/HOL



An approach to efficiently eliminating leaks through shared state e.g. caches.

Only switch to a domain with higher clearance, or to the downgrader, which clears the cache:

scheduleL $\equiv cd :\in \lambda s. \{n | (cd, n) \in S\}$



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Only switch to a domain with higher clearance, or to the downgrader, which clears the cache:

scheduleL
$$\equiv cd :\in \lambda s. \{n | (cd, n) \in S\}$$

The security property:

$$orall c, n. \ (c, n) \in S
ightarrow ext{sec_class.} c \leq ext{sec_class.} n \lor n = ext{downgrader}$$



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Example: Lattice-Lottery Scheduler





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Example: Lattice-Lottery Scheduler

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Example: Lattice-Lottery Scheduler







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Example: Lattice-Lottery Scheduler

A single-period schedule cannot include both L_a and L_b .

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Example: Lattice-Lottery Scheduler

A single-period schedule cannot include both L_a and L_b .

A nondeterministic scheduler might simply always pick L_b .
We'd still like to have asymptotic fairness between domains.



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Example: Lattice-Lottery Scheduler

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We'd still like to have asymptotic fairness between domains. Start by randomising:

scheduleR $\equiv cd :\in UNIV$ at $(\lambda s n. T (cd, n))$



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We'd still like to have asymptotic fairness between domains. Start by randomising:

scheduleR \equiv *cd* : \in UNIV at (λ *s n*. *T* (*cd*, *n*))

If the matrix T satisfies:

 $orall c n. \ 0 < T \ (c, n)
ightarrow (c, n) \in S$

we have refinement, scheduleL \sqsubseteq scheduleR.



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We'd still like to have asymptotic fairness between domains. Start by randomising:

scheduleR $\equiv cd := UNIV$ at $(\lambda s n. T (cd, n))$

If the matrix T satisfies:

 $\forall c n. 0 < T (c, n) \rightarrow (c, n) \in S$

we have refinement, scheduleL \sqsubseteq scheduleR.

This scheduler is a Markov process, and if T is irreducible and positive recurrent, there exists a stationary distribution.



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An efficient implementation might use a lottery:

```
scheduleM t \equiv do

c \leftarrow gets cd; l \leftarrow gets lottery;

let n = l \ c \ t in modify(\lambda s. \ s(cd := n))

od
```

The lottery has type: domain \Rightarrow word32 \Rightarrow domain.



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```

The lottery has type: domain \Rightarrow word32 \Rightarrow domain. We chain in probability from above:

scheduleC $\equiv t$ from UNIV at 2⁻³² in Exec (scheduleM *t*)



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We cannot show that schedule $R \sqsubseteq$ schedule C, as they operate on different state spaces:

record state A = cd :: domain

record stateC = cd :: domain,

 $\mathsf{lottery}::\mathsf{domain}\Rightarrow\mathsf{word32}\Rightarrow\mathsf{domain}$



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We cannot show that schedule $R \sqsubseteq$ schedule C, as they operate on different state spaces:

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The lottery is an implementation detail, only *cd* matters.



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We cannot show that schedule $R \sqsubseteq$ schedule C, as they operate on different state spaces:

record stateA = cd :: domain **record** stateC = cd :: domain, lottery :: domain \Rightarrow word32 \Rightarrow domain

The lottery is an implementation detail, only *cd* matters. Take the natural projection: ϕ :: stateC \Rightarrow stateA.



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$$\frac{a \sqsubseteq_{\phi, Pre} b \quad E \vdash \wp \ a \ F \quad Pre \ s}{(E \circ \phi) \ s \vdash \wp \ b \ (F \circ \phi) \ s}$$



Verification

Example: Lattice-Lottery Scheduler

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$$\frac{a \sqsubseteq_{\phi, Pre} b \quad E \vdash \wp \ a \ F \quad Pre \ s}{(E \circ \phi) \ s \vdash \wp \ b \ (F \circ \phi) \ s}$$

If the ticket distribution represents the transition matrix:

$$LR \ s \equiv \forall c, n. \ T(c, n) = \sum_{t. \text{ lottery } s \ c \ t=n} 2^{-32}$$

we have another refinement step:



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 $\mathsf{scheduleL} \sqsubseteq \mathsf{scheduleR}$



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$$\frac{a \sqsubseteq_{\phi, Pre} b \quad E \vdash \wp \ a \ F \quad Pre \ s}{(E \circ \phi) \ s \vdash \wp \ b \ (F \circ \phi) \ s}$$

If the ticket distribution represents the transition matrix:

$$LR \ s \equiv \forall c, n. \ T(c, n) = \sum_{t. \text{ lottery } s \ c \ t=n} 2^{-32}$$

we have another refinement step:

scheduleL \sqsubseteq scheduleR $\sqsubseteq_{\phi,LR}$ scheduleC



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stepKernel \equiv callKernel; scheduleC



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Example: Lattice-Lottery Scheduler

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stepKernel \equiv callKernel; scheduleC

We need only a few high-level properties, including:

 $\{cd = d\}$ callKernel $\{cd = d\}$

which is a specification in the L4.verified Hoare logic, from which we establish:



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stepKernel \equiv callKernel; scheduleC

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 $\{cd = d\}$ callKernel $\{cd = d\}$

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Skip $\sqsubseteq_{\phi,LR}$ callKernel

The kernel may modify the lottery!



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Example: Lattice-Lottery Scheduler

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 $\{LR\}$ callKernel $\{LR\}$

then we have the full refinement chain:



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Example: Lattice-Lottery Scheduler

 $\{LR\}$ callKernel $\{LR\}$

then we have the full refinement chain:

 $\mathsf{scheduleL}\sqsubseteq\mathsf{scheduleR}$



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 $\{LR\}$ callKernel $\{LR\}$

then we have the full refinement chain:

scheduleL \sqsubseteq scheduleR $\sqsubseteq_{\phi,LR}$ stepKernel



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 $\{LR\}$ callKernel $\{LR\}$

then we have the full refinement chain:

scheduleL \sqsubseteq scheduleR $\sqsubseteq_{\phi,LR}$ stepKernel

The kernel implements a fair, secure scheduler.



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We have:



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Example: Lattice-Lottery Scheduler

We have:

Motivated probabilistic verification for systems.





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Functional vs Probabilistic Verification

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Example: Lattice-Lottery Scheduler

We have:

- Motivated probabilistic verification for systems.
- Mechanised pGCL in Isabelle/HOL.

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Example: Lattice-Lottery Scheduler

We have:

- Motivated probabilistic verification for systems.
- Mechanised pGCL in Isabelle/HOL.
- · Verified a randomised scheduler.



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Questions?

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